

Similar risk of kidney failure among patients with blinding diseases who receive ranibizumab, aflibercept, and bevacizumab: an OHDSI Network Study

Cindy X. Cai, MD

The Jonathan and Marcia Javitt Rising Professor

Assistant Professor of Ophthalmology, Retina Division, The Wilmer Eye Institute

Assistant Professor of Medicine, Biomedical Informatics and Data Science, Division of General Internal Medicine, Department of Medicine

Johns Hopkins University School of Medicine

6/25/2024



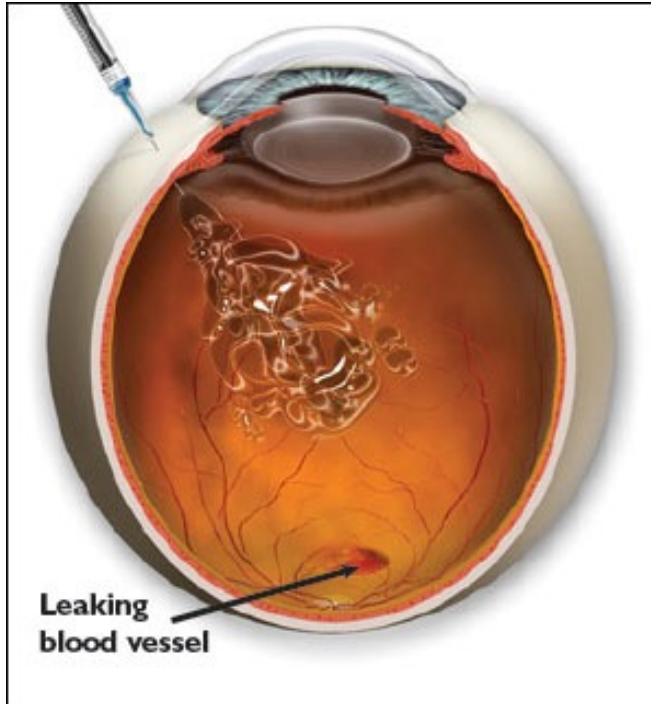
SOS Challenge Weekly Tutorial Schedule 2023

Date	Times	Topic
Mar. 28	11 am / 7 pm ET	SOS Week 1 Tutorial: Initiating A Network Study
Apr. 4	11 am / 7 pm ET	SOS Week 2 Tutorial: Data Diagnostics
Apr. 11	11 am / 7 pm ET	SOS Week 3 Tutorial: Phenotype Development
Apr. 18	11 am / 7 pm ET	SOS Week 4 Tutorial: Phenotype Evaluation
Apr. 25	11 am / 7 pm ET	SOS Week 5 Tutorial: Creating Analysis Specifications
May 2	11 am / 7 pm ET	SOS Week 6 Tutorial: Network Execution
May 9	11 am / 7 pm ET	SOS Week 7 Tutorial: Study Diagnostics
May 16	11 am / 7 pm ET	SOS Week 8 Tutorial: Evidence Synthesis
May 23	11 am / 7 pm ET	SOS Week 9 Tutorial: Interpreting The Results

Background: anti-VEGF medications

- Systemic administration of anti-VEGF agents have known **adverse kidney side effects**
 - Acute kidney injury
 - Proteinuria
 - Hypertension
 - Vascular clotting events
 - Glomerular disease
 - Risk factors for: kidney failure (need for renal replacement therapy with dialysis or kidney transplant, aka end stage kidney disease or end stage renal disease)

Intravitreal Anti-VEGF and Systemic Absorption



Drug	Size	Systemic Elimination (half-life)
Ranibizumab	48 kDa	2 hours
Aflibercept	115 kDa	5-6 days
Bevacizumab	149 kDa	20 days

Detectable/elevated serum drug levels
Decreased plasma concentrations of free-VEGF

Bevacizumab > aflibercept >> ranibizumab

Question: Is there evidence for preferentially choosing ranibizumab to lower the risk of kidney failure?

Pilot Study (OHDSI SOS Challenge): Intravitreal anti-VEGF and Kidney Failure

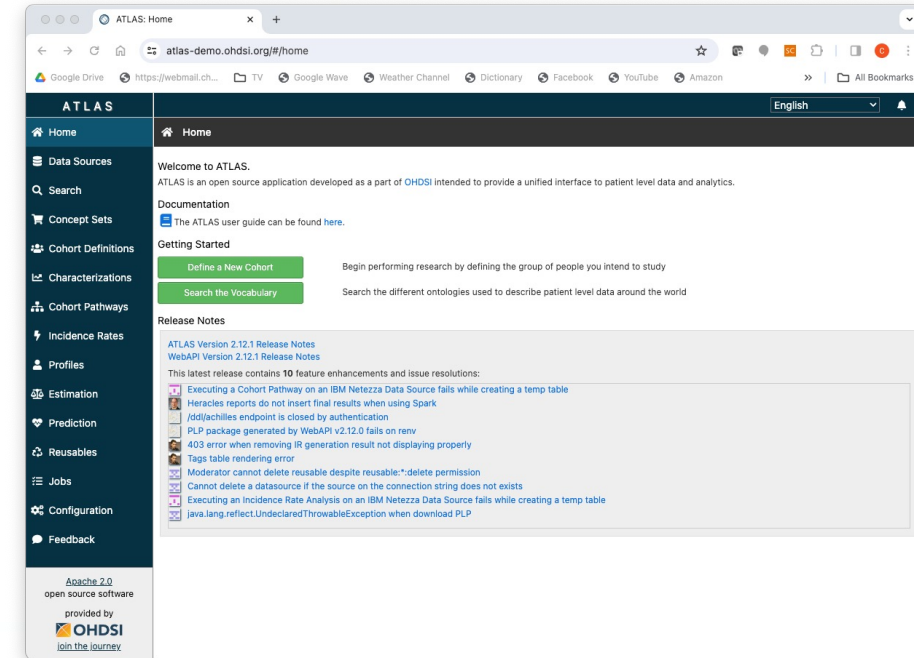
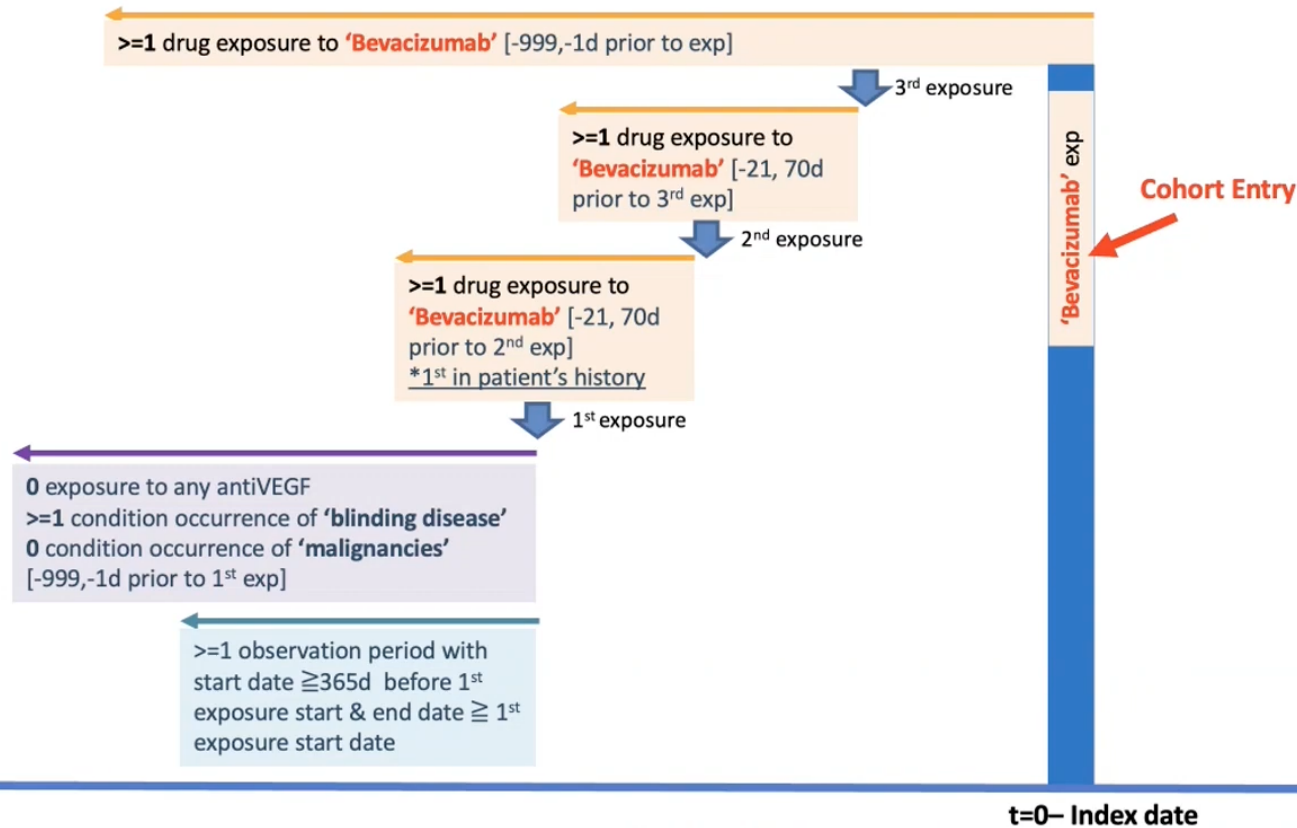
- Is the risk of **kidney failure** associated with **intravitreal anti-VEGF** exposure in patients with blinding diseases (DR/DME, AMD, VO) different among patients who receive **ranibizumab**, **aflibercept**, and **bevacizumab**?

Hypothesis: in pairwise comparisons, lower risk of kidney failure in patients with blinding diseases who are exposed to ranibizumab, as compared to aflibercept or bevacizumab

OHDSI Tools: Atlas



Target cohort definition: bevacizumab



New users of anti-VEGF (3 monthly loading doses)
DR/DME, AMD, VO
 ≥ 1 year observation prior observation
Exclude systemic malignancies

Atlas: publicly available, web-based tool

OHDSI Tools: Strategus pipeline, HADES packages

Analysis #1:

- Incidence rate of kidney failure while on treatment with anti-VEGF

The screenshot shows the HADES website interface. At the top is a navigation bar with the HADES logo and links for Home, Packages, Validation, Publications, Support, Study packages, and Developers. On the left is a sidebar menu with categories: Population-level estimation (highlighted), Patient-level prediction, Characterization, Cohort construction and evaluation, Evidence Quality, and Supporting packages. The main content area is titled 'Packages' and contains a sub-section for 'Population-level estimation' with three packages: CohortMethod, SelfControlledCaseSeries, and SelfControlledCohort. Below that is the 'EvidenceSynthesis' package. The next sub-section is 'Patient-level prediction' with three packages: PatientLevelPrediction, DeepPatientLevelPrediction, and EnsemblePatientLevelPrediction. The final sub-section is 'Characterization' with one package, 'Characterization', which is highlighted with a red border. Each package card includes a title, a brief description, and a 'Learn more...' link.

HADES

Home Packages Validation Publications Support Study packages Developers

Packages

Below are the packages included in HADES. For each package a link is provided with more information, including instructions on how to install and use the package.

Population-level estimation

- CohortMethod**
New-user cohort studies using large-scale regression for propensity and outcome models.
[Learn more...](#)
- SelfControlledCaseSeries**
Self-Controlled Case Series analysis using few or many predictors, includes splines for age and seasonality.
[Learn more...](#)
- SelfControlledCohort**
A self-controlled cohort design, where time preceding exposure is used as control.
[Learn more...](#)
- EvidenceSynthesis**
Routines for combining causal effect estimates and study diagnostics across multiple data sites in a distributed study.
[Learn more...](#)

Patient-level prediction

- PatientLevelPrediction**
Build and evaluate predictive models for user-specified outcomes, using a wide array of machine learning algorithms.
[Learn more...](#)
- DeepPatientLevelPrediction**
Performing patient level prediction using deep learning
[Learn more...](#)
- EnsemblePatientLevelPrediction**
Building and validating ensemble patient-level predictive models.
[Learn more...](#)

Characterization

- Characterization**
Various types of characterizations of a target and outcome cohort.
[Learn more...](#)

OHDSI Tools: Strategus pipeline, HADES packages

Analysis #2:

- Large-scale propensity score method to match patients in each comparison group using 1:1 propensity score matching
- Cox proportional hazards models to estimate risk of kidney failure while on treatment
- Random effects meta-analysis was performed to combine per site hazard ratio estimates into a single network-wide estimate

The screenshot shows the HADES website interface. At the top is a dark navigation bar with the HADES logo and links for Home, Packages, Validation, Publications, Support, Study packages, and Developers. Below the navigation bar is a left-hand menu with categories: Population-level estimation (highlighted in blue), Patient-level prediction, Characterization, Cohort construction and evaluation, Evidence Quality, and Supporting packages. The main content area is titled 'Packages' and contains a sub-section for 'Population-level estimation'. This sub-section features three package cards: 'CohortMethod' (highlighted with a red border), 'SelfControlledCaseSeries', and 'SelfControlledCohort'. Below this, there is a sub-section for 'Patient-level prediction' with three cards: 'PatientLevelPrediction', 'DeepPatientLevelPrediction', and 'EnsemblePatientLevelPrediction'. At the bottom, there is a 'Characterization' sub-section with one card: 'Characterization'. Each card provides a brief description of the package's function and a 'Learn more...' link.

HADES

Packages

Validation

Publications

Support

Study packages

Developers

Packages

Below are the packages included in HADES. For each package a link is provided with more information, including instructions on how to install and use the package.

Population-level estimation

- CohortMethod**
New-user cohort studies using large-scale regression for propensity and outcome models.
[Learn more...](#)
- EvidenceSynthesis**
Routines for combining causal effect estimates and study diagnostics across multiple data sites in a distributed study.
[Learn more...](#)
- SelfControlledCaseSeries**
Self-Controlled Case Series analysis using few or many predictors, includes splines for age and seasonality.
[Learn more...](#)
- SelfControlledCohort**
A self-controlled cohort design, where time preceding exposure is used as control.
[Learn more...](#)

Patient-level prediction

- PatientLevelPrediction**
Build and evaluate predictive models for user-specified outcomes, using a wide array of machine learning algorithms.
[Learn more...](#)
- DeepPatientLevelPrediction**
Performing patient level prediction using deep learning
[Learn more...](#)
- EnsemblePatientLevelPrediction**
Building and validating ensemble patient-level predictive models.
[Learn more...](#)

Characterization

- Characterization**
Various types of characterizations of a target and outcome cohort.
[Learn more...](#)

Anti-VEGF OHDSI Study: Process



SOS Challenge Weekly Tutorial Schedule

Date	Times	Topic
Mar. 28	11 am / 7 pm ET	SOS Week 1 Tutorial: Initiating A Network Study
Apr. 4	11 am / 7 pm ET	SOS Week 2 Tutorial: Data Diagnostics
Apr. 11	11 am / 7 pm ET	SOS Week 3 Tutorial: Phenotype Development
Apr. 18	11 am / 7 pm ET	SOS Week 4 Tutorial: Phenotype Evaluation
Apr. 25	11 am / 7 pm ET	SOS Week 5 Tutorial: Creating Analysis Specifications
May 2	11 am / 7 pm ET	SOS Week 6 Tutorial: Network Execution
May 9	11 am / 7 pm ET	SOS Week 7 Tutorial: Study Diagnostics
May 16	11 am / 7 pm ET	SOS Week 8 Tutorial: Evidence Synthesis
May 23	11 am / 7 pm ET	SOS Week 9 Tutorial: Interpreting The Results

@OHDSI

www.ohdsi.org

#JoinTheJourney

ohdsi

Administrative Claims Databases

IBM Health MarketScan Medicare Supplemental and Coordination of Benefits Database (MDCR)

IBM Health MarketScan Commercial Claims and Encounters Database (CCAE)

IBM Health MarketScan Multi-State Medicaid Database (MDCD)

Optum's de-identified Clinformatics® Data Mart Database - Socio-economic Status (SES)

Japan Medical Data Center (JMDC)

IQVIA PharMetrics® Plus for Academics Database (NEU)

Electronic Health Record Databases

Optum® de-identified Electronic Health Record data set (Optum EHR)

Johns Hopkins Medical Enterprise (JHME)

Department of Veterans Affairs (VA)

Columbia University Medical Center (CUMC)

Stanford University (STARR)

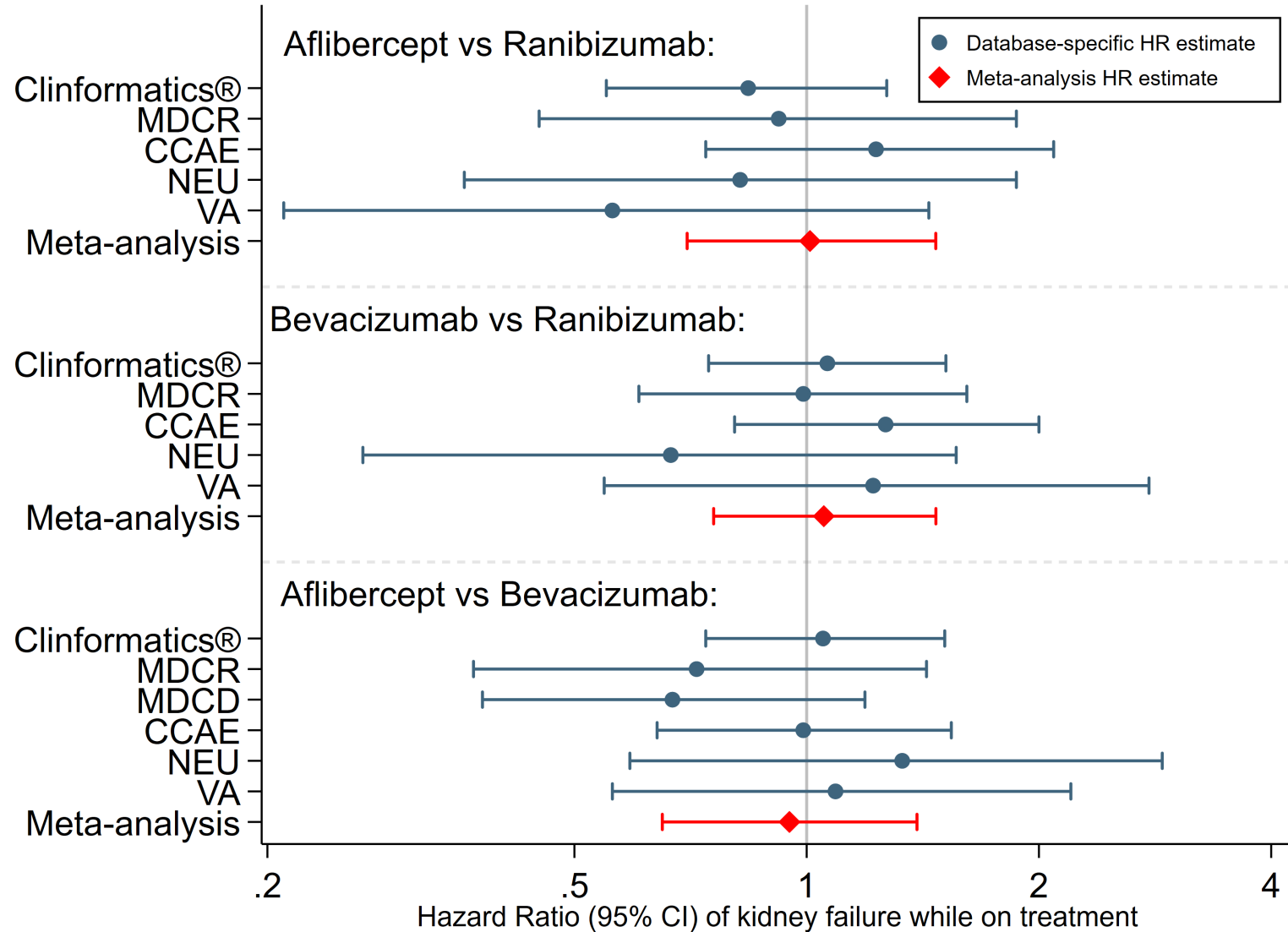
University of Southern California (USC)

Collectively: 485 million patients

Anti-VEGF OHDSI Study: Results

- 6.1 million patients with blinding diseases (DR/DME, AMD, VO)
 - 240,247 new users of monthly anti-VEGF
 - 37,189 received ranibizumab
 - 39,447 aflibercept
 - 163,611 bevacizumab
 - 1209 kidney failure outcomes
- Age-sex standardized incidence proportion of kidney failure: **680 per 100,000** persons
 - [US Renal Data System: age-sex standardized incidence proportion of 36.3 per 100,000 persons in 2020]

Anti-VEGF OHDSI Study: Results



Conclusions

- No difference in the risk of kidney failure among patients who receive ranibizumab, aflibercept, bevacizumab
- Ophthalmologists are free to choose between intravitreal anti-VEGF agents

Conclusions

- Speed and scale of observational health research when there is a CDM, well-established distributed data network, open-source tooling
 - Analysis in 9 weeks
 - Project initiation to publication 1 year
- Great value and potential for distributed data network studies in ophthalmology





Similar Risk of Kidney Failure among Patients with Blinding Diseases Who Receive Ranibizumab, Aflibercept, and Bevacizumab

An Observational Health Data Sciences and Informatics Network Study

Cindy X. Cai, MD, MS,¹ Akihiko Nishimura, PhD,² Mary G. Bowring, MPH,³ Erik Westlund, PhD,² Diep Tran, MSc,¹ Jia H. Ng, MD, MSCE,⁴ Paul Nagy, PhD,⁵ Michael Cook, BS,⁶ Jody-Ann McLeggon, MPH,⁷ Scott L. DuVall, PhD,^{8,9} Michael E. Matheny, MD, MPH,^{10,11} Asieh Golozar, PhD,^{12,13} Anna Ostropelets, MD, PhD,¹² Evan Minty, MD, MSc,¹⁴ Priya Desai, MS,¹⁵ Fan Bu, PhD,¹⁶ Brian Toy, MD,¹⁷ Michelle Hribar, PhD,^{18,19} Thomas Falconer, MS,⁷ Linying Zhang, PhD,⁷ Laurence Lawrence-Archer, MSc,^{12,13} Michael V. Boland, MD, PhD,²⁰ Kerry Goetz, MS,¹⁸ Nathan Hall, MS,²¹ Azza Shoaibi, PhD,²¹ Jenna Repts, PhD,²¹ Anthony G. Sena, BA,^{21,22} Clair Blacketer, MPH,²¹ Joel Swerdel, PhD, MPH,²¹ Kenar D. Jhaveri, MD,²³ Edward Lee, BS,¹⁷ Zachary Gilbert, BS,¹⁷ Scott L. Zeger, PhD,² Deidra C. Crews, MD, ScM,²⁴ Marc A. Suchard, MD, PhD,^{8,16} George Hripacsak, MD, MS,⁷ Patrick B. Ryan, PhD²¹

2024 Mar 20:S2468-6530(24)00118-0. doi: 10.1016/j.oret.2024.03.014.
Online ahead of print.

